# Package 'zellkonverter'

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**Description** Provides methods to convert between Python AnnData objects and SingleCellExperiment objects. These are primarily intended for use by downstream Bioconductor packages that wrap Python methods for single-cell data analysis. It also includes functions to read and write H5AD files used for saving AnnData objects to disk.

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2 zellkonverter-package

```
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## **R** topics documented:

	zellkonverter-package		2
	AnnData-Conversion		
	AnnData-Environment		
	expectSCE		
	readH5AD		7
	setZellkonverterVerbose		
	validateH5ADSCE		10
	writeH5AD		11
Index			14

zellkonverter-package zellkonverter: Conversion Between scRNA-seq Objects

## **Description**

Provides methods to convert between Python AnnData objects and SingleCellExperiment objects. These are primarily intended for use by downstream Bioconductor packages that wrap Python methods for single-cell data analysis. It also includes functions to read and write H5AD files used for saving AnnData objects to disk.

## Author(s)

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#### See Also

Useful links:

- https://github.com/theislab/zellkonverter
- Report bugs at https://github.com/theislab/zellkonverter/issues

AnnData-Conversion 3

AnnData-Conversion

Convert AnnData between and SingleCellExperiment

## Description

Conversion between Python AnnData objects and SingleCellExperiment objects.

## Usage

```
AnnData2SCE(
  adata,
  X_name = NULL,
  layers = TRUE,
  uns = TRUE,
  var = TRUE,
  obs = TRUE,
  varm = TRUE,
  obsm = TRUE,
  varp = TRUE,
  obsp = TRUE,
  raw = FALSE,
  skip_assays = FALSE,
  hdf5_backed = TRUE,
  verbose = NULL
)
SCE2AnnData(
  sce,
  X_name = NULL,
  assays = TRUE,
  colData = TRUE,
  rowData = TRUE,
  varm = TRUE,
  reducedDims = TRUE,
 metadata = TRUE,
  colPairs = TRUE,
  rowPairs = TRUE,
  skip_assays = FALSE,
  verbose = NULL
)
```

## **Arguments**

adata

A reticulate reference to a Python AnnData object.

X\_name

For SCE2AnnData() name of the assay to use as the primary matrix (X) of the AnnData object. If NULL, the first assay of sce will be used by default. For

4 AnnData-Conversion

AnnData2SCE() name used when saving X as an assay. If NULL looks for an  $X_n$  are value in uns, otherwise uses "X".

layers, uns, var, obs, varm, obsm, varp, obsp, raw

Arguments specifying how these slots are converted. If TRUE everything in that slot is converted, if FALSE nothing is converted and if a character vector only

those items or columns are converted.

skip\_assays Logical scalar indicating whether to skip conversion of any assays in sce or

adata, replacing them with empty sparse matrices instead.

hdf5\_backed Logical scalar indicating whether HDF5-backed matrices in adata should be

represented as HDF5Array objects. This assumes that adata is created with

backed="r".

verbose Logical scalar indicating whether to print progress messages. If NULL uses

getOption("zellkonverter.verbose").

sce A SingleCellExperiment object.

assays, colData, rowData, reducedDims, metadata, colPairs, rowPairs

Arguments specifying how these slots are converted. If TRUE everything in that slot is converted, if FALSE nothing is converted and if a character vector only

those items or columns are converted.

#### **Details**

These functions assume that an appropriate Python environment has already been loaded. As such, they are largely intended for developer use, most typically inside a **basilisk** context.

The conversion is not entirely lossless. The current mapping is shown below (also at <a href="https://tinyurl.com/AnnData2SCE">https://tinyurl.com/AnnData2SCE</a>):

	SingleCellExperiment					AnnData			
	R object used by Bi	s			Python object used by Scar	npy and related packages			
	Rows contain features and columns contain cells				Rows contain observations (cells) and columns contain variables (features)				
					x	Numpy array	Primary matrix of expression data		
	Each element is a matrix of expression values with the same dimensions	SimpleList of matrices	assays	≉	layers	Dictionary of arrays	Dictionary-like object where each element is an array of expression values with the same dimensions as X		
	Any unstructured data	list	metadata	<b>‡</b>	uns	OrderedDict	Unstructured annotation		
	Names of rows (cells)	vector	colnames	≉	obs_names	Pandas index	Names of observations (cells)		
	Columns describe annotations of the columns (cells)	DataFrame	colData	≉	obs	Pandas DataFrame	One-dimensional annotations of the observations (cells)		
EMENTED	Each element is a matrix where the number of rows is equal to the number of cells and each column is a dimension	List of matrices	reducedDims	≉	obsm	Dictionary of arrays	Dictionary-like object where each element is an array where the number of rows is equal to the number of observations (cells)		
IMPLEA	Relationships between columns (cells)	List of SelfHits	colPairs	≉	obsp	Dictionary of arrays	Dictionary-like object where each element is a square array containing annotations between observations (cells)		
	Names of rows (features)	vector	rownames	<b></b>	var_names	Pandas index	Names of variables (features)		
	Columns describe annotations of the rows	DataFrame		≉	vars	Pandas DataFrame	One-dimensional annotations of the variables (features)		
	(features)		DataFrame	rowDate	<b></b>	varm	Dictionary of arrays	Dictionary-like object where each element is an array where the number of rows is equal to the number of variables (features)	
	Relationships between rows (features)	List of SelfHits	rowPairs	<b></b>	varp	Dictionary of arrays	Dictionary-like object where each element is a square array containing annotations between variables (features)		
a	Nested SingleCellExperiments with information about alternative feature sets	List of SingleCellExperiments	altExp		raw	AnnData	Raw version of X and var prior to any filtering. Is not indexed as part of the object.		
IMPLMENT	Internal unstructured data that is not meant to be modified by users	list	int_metadata						
T IMP	Internal annotation for columns (cells) that is not meant to be modified by users	DataFrame	int_colData						
NOT	Internal annotation for rows (features) that is not meant to be modified by users	DataFrame	int_elementMetadata						

In SCE2AnnData(), matrices are converted to a **numpy**-friendly format. Sparse matrices are converted to dgCMatrix objects while all other matrices are converted into ordinary matrices. If skip\_assays = TRUE, empty sparse matrices are created instead and the user is expected to fill in the assays on the Python side.

AnnData-Conversion 5

For AnnData2SCE(), a warning is raised if there is no corresponding R format for a matrix in the AnnData object, and an empty sparse matrix is created instead as a placeholder. If skip\_assays = NA, no warning is emitted but variables are created in the int\_metadata() of the output to specify which assays were skipped.

If skip\_assays = TRUE, empty sparse matrices are created for all assays, regardless of whether they might be convertible to an R format or not. In both cases, the user is expected to fill in the assays on the R side, see readH5AD() for an example.

We attempt to convert between items in the SingleCellExperiment metadata() slot and the AnnData uns slot. If an item cannot be converted a warning will be raised.

Values stored in the varm slot of an AnnData object are stored in a column of rowData() in a SingleCellExperiment as a DataFrame of matrices. If this column is present an attempt is made to transfer this information when converting from SingleCellExperiment to AnnData.

#### Value

AnnData2SCE() will return a SingleCellExperiment containing the equivalent data from adata. SCE2AnnData() will return a **reticulate** reference to an AnnData object containing the content of sce.

#### Author(s)

Luke Zappia Aaron Lun

#### See Also

writeH5AD() and readH5AD() for dealing directly with H5AD files.

## **Examples**

```
if (requireNamespace("scRNAseq", quietly = TRUE)) {
    library(basilisk)
    library(scRNAseq)
    seger <- SegerstolpePancreasData()

# These functions are designed to be run inside
    # a specified Python environment
    roundtrip <- basiliskRun(fun = function(sce) {
        # Convert SCE to AnnData:
        adata <- zellkonverter::SCE2AnnData(sce)

        # Maybe do some work in Python on 'adata':
        # BLAH BLAH

        # Convert back to an SCE:
        zellkonverter::AnnData2SCE(adata)
    }, env = zellkonverterAnnDataEnv, sce = seger)
}</pre>
```

6 AnnData-Environment

AnnData-Environment AnnData environment

## **Description**

The Python environment used by **zellkonverter** for interfacing with the **anndata** Python library (and H5AD files) is described by the dependencies in .AnnDataDependencies. The zellkonverterAnnDataEnv variable is the basilisk::BasiliskEnvironment() used by **zellkonverter**.

## Usage

.AnnDataDependencies
zellkonverterAnnDataEnv

#### **Format**

A character vector containing the pinned versions of all Python packages in zellkonverterAnnDataEnv.

A basilisk::BasiliskEnvironment() containing **zellkonverter**'s AnnData Python environment.

#### **Details**

The .AnnDataDependencies variable is exposed for use by other package developers who want an easy way to define the dependencies required for creating a Python environment to work with AnnData objects, most typically within a **basilisk** context. For example, we can simply combine this vector with additional dependencies to create a **basilisk** environment with Python package versions that are consistent with those in **zellkonverter**.

If you want to run code in the exact environment used by **zellkonverter** this can be done using zellkonverterAnnDataEnv in combination with basilisk::basiliskStart() and/or basilisk::basiliskRun(). Please refer to the **basilisk** documentation for more information on using these environments.

## Author(s)

Luke Zappia Aaron Lun

#### **Examples**

 $. {\tt AnnDataDependencies}$ 

cl <- basilisk::basiliskStart(zellkonverterAnnDataEnv)
anndata <- reticulate::import("anndata")
basilisk::basiliskStop(cl)</pre>

expectSCE 7

expectSCE

Expect SCE

## Description

Test that a SingleCellExperiment matches an expected object. Designed to be used inside testhat::test\_that() during package testing.

## Usage

```
expectSCE(sce, expected)
```

## Arguments

sce A SingleCellExperiment object.

expected A template SingleCellExperiment object to compare to.

## Value

TRUE invisibly if checks pass

## Author(s)

Luke Zappia

readH5AD

Read H5AD

## Description

Reads a H5AD file and returns a SingleCellExperiment object.

## Usage

```
readH5AD(
   file,
   X_name = NULL,
   use_hdf5 = FALSE,
   reader = c("python", "R"),
   verbose = NULL,
   ...
)
```

8 readH5AD

#### **Arguments**

file String containing a path to a . h5ad file.

X\_name Name used when saving X as an assay. If NULL looks for an X\_name value in uns,

otherwise uses "X".

use\_hdf5 Logical scalar indicating whether assays should be loaded as HDF5-based ma-

trices from the HDF5Array package.

reader Which HDF5 reader to use. Either "python" for reading with the **anndata** 

Python package via **reticulate** or "R" for **zellkonverter**'s native R reader.

verbose Logical scalar indicating whether to print progress messages. If NULL uses

getOption("zellkonverter.verbose").

.. Arguments passed on to AnnData2SCE

layers Arguments specifying how these slots are converted. If TRUE everything in that slot is converted, if FALSE nothing is converted and if a character vector only those items or columns are converted.

uns Arguments specifying how these slots are converted. If TRUE everything in that slot is converted, if FALSE nothing is converted and if a character vector only those items or columns are converted.

var Arguments specifying how these slots are converted. If TRUE everything in that slot is converted, if FALSE nothing is converted and if a character vector only those items or columns are converted.

obs Arguments specifying how these slots are converted. If TRUE everything in that slot is converted, if FALSE nothing is converted and if a character vector only those items or columns are converted.

varm Arguments specifying how these slots are converted. If TRUE everything in that slot is converted, if FALSE nothing is converted and if a character vector only those items or columns are converted.

obsm Arguments specifying how these slots are converted. If TRUE everything in that slot is converted, if FALSE nothing is converted and if a character vector only those items or columns are converted.

varp Arguments specifying how these slots are converted. If TRUE everything in that slot is converted, if FALSE nothing is converted and if a character vector only those items or columns are converted.

obsp Arguments specifying how these slots are converted. If TRUE everything in that slot is converted, if FALSE nothing is converted and if a character vector only those items or columns are converted.

raw Arguments specifying how these slots are converted. If TRUE everything in that slot is converted, if FALSE nothing is converted and if a character vector only those items or columns are converted.

skip\_assays Logical scalar indicating whether to skip conversion of any assays in sce or adata, replacing them with empty sparse matrices instead.

#### **Details**

Setting use\_hdf5 = TRUE allows for very large datasets to be efficiently represented on machines with little memory. However, this comes at the cost of access speed as data needs to be fetched from the HDF5 file upon request.

setZellkonverterVerbose 9

When first run, this function will instantiate a conda environment containing all of the necessary dependencies. This will not be performed on any subsequent run or if any other **zellkonverter** function has been run prior to this one.

Setting reader = "R" will use an experimental native R reader instead of reading the file into Python and converting the result. This avoids the need for a Python environment and some of the issues with conversion but is still under development and is likely to return slightly different output.

#### Value

A SingleCellExperiment object is returned.

#### Author(s)

Luke Zappia Aaron Lun

#### See Also

```
writeH5AD(), to write a SingleCellExperiment object to a H5AD file.

AnnData2SCE(), for developers to convert existing AnnData instances to a SingleCellExperiment.
```

## **Examples**

```
library(SummarizedExperiment)

file <- system.file("extdata", "krumsiek11.h5ad", package = "zellkonverter")
sce <- readH5AD(file)
class(assay(sce))

sce2 <- readH5AD(file, use_hdf5 = TRUE)
class(assay(sce2))
sce3 <- readH5AD(file, reader = "R")</pre>
```

setZellkonverterVerbose

Set zellkonverter verbose

### **Description**

Set the zellkonverter verbosity option

#### Usage

```
setZellkonverterVerbose(verbose = TRUE)
```

#### **Arguments**

verbose

Logical value for the verbosity option.

10 validateH5ADSCE

#### **Details**

Running setZellkonverterVerbose(TRUE) will turn on **zellkonverter** progress messages by default without having to set verbose = TRUE in each function call. This is done by setting the "zellkonverter.verbose" option. Running setZellkonverterVerbose(FALSE) will turn default verbosity off.

#### Value

The value of getOption("zellkonverter.verbose") invisibly

### **Examples**

```
current <- getOption("zellkonverter.verbose")
setZellkonverterVerbose(TRUE)
getOption("zellkonverter.verbose")
setZellkonverterVerbose(FALSE)
getOption("zellkonverter.verbose")
setZellkonverterVerbose(current)
getOption("zellkonverter.verbose")</pre>
```

validateH5ADSCE

Validate H5AD SCE

## Description

Validate a SingleCellExperiment created by readH5AD(). Designed to be used inside testhat::test\_that() during package testing.

## Usage

```
validateH5ADSCE(sce, names, missing)
```

## **Arguments**

sce A SingleCellExperiment object.

names Named list of expected names. Names are slots and values are vectors of names

that are expected to exist in that slot.

missing Named list of known missing names. Names are slots and values are vectors of

names that are expected to not exist in that slot.

#### **Details**

This function checks that a SingleCellExperiment contains the expected items in each slot. The main reason for this function is avoid repeating code when testing multiple .h5ad files. The following items in names and missing are recognised:

· assays - Assay names

writeH5AD

- colData colData column names
- rowData rowData column names
- metadata metadata names
- redDim Reduced dimension names
- varm Column names of the varm rowData column (from the AnnData varm slot)
- colPairs Column pair names
- rowPairs rowData pair names
- raw\_rowData rowData columns names in the raw altExp
- raw\_varm Column names of the raw varm rowData column (from the AnnData varm slot)

If an item in names or missing is NULL then it won't be checked. The items in missing are checked that they explicitly do not exist. This is mostly for record keeping when something is known to not be converted but can also be useful when the corresponding names item is NULL.

#### Value

If checks are successful TRUE invisibly, if not other output depending on the context

## Author(s)

Luke Zappia

writeH5AD

Write H5AD

## Description

Write a H5AD file from a SingleCellExperiment object.

## Usage

```
writeH5AD(
    sce,
    file,
    X_name = NULL,
    skip_assays = FALSE,
    compression = c("none", "gzip", "lzf"),
    verbose = NULL,
    ...
)
```

12 writeH5AD

#### **Arguments**

sce A SingleCellExperiment object.

file String containing a path to write the new .h5ad file.

X\_name Name of the assay to use as the primary matrix (X) of the AnnData object. If

NULL, the first assay of sce will be used by default.

skip\_assays Logical scalar indicating whether assay matrices should be ignored when writing

to file.

compression Type of compression when writing the new .h5ad file.

verbose Logical scalar indicating whether to print progress messages. If NULL uses

getOption("zellkonverter.verbose").

... Arguments passed on to SCE2AnnData

varm Arguments specifying how these slots are converted. If TRUE everything in that slot is converted, if FALSE nothing is converted and if a character vector only those items or columns are converted.

assays Arguments specifying how these slots are converted. If TRUE everything in that slot is converted, if FALSE nothing is converted and if a character vector only those items or columns are converted.

colData Arguments specifying how these slots are converted. If TRUE everything in that slot is converted, if FALSE nothing is converted and if a character vector only those items or columns are converted.

rowData Arguments specifying how these slots are converted. If TRUE everything in that slot is converted, if FALSE nothing is converted and if a character vector only those items or columns are converted.

reducedDims Arguments specifying how these slots are converted. If TRUE everything in that slot is converted, if FALSE nothing is converted and if a character vector only those items or columns are converted.

metadata Arguments specifying how these slots are converted. If TRUE everything in that slot is converted, if FALSE nothing is converted and if a character vector only those items or columns are converted.

colPairs Arguments specifying how these slots are converted. If TRUE everything in that slot is converted, if FALSE nothing is converted and if a character vector only those items or columns are converted.

rowPairs Arguments specifying how these slots are converted. If TRUE everything in that slot is converted, if FALSE nothing is converted and if a character vector only those items or columns are converted.

## **Details**

#### **Environment:**

When first run, this function will instantiate a conda environment containing all of the necessary dependencies. This will not be performed on any subsequent run or if any other **zellkonverter** function has been run prior to this one.

#### **Skipping assays:**

writeH5AD

Setting skip\_assays = TRUE can occasionally be useful if the matrices in sce are stored in a format that is not amenable for efficient conversion to a **numpy**-compatible format. In such cases, it can be better to create an empty placeholder dataset in file and fill it in R afterwards.

#### DelayedArray assays:

If sce contains any **DelayedArray** matrices as assays writeH5AD() will write them to disk using the **rhdf5** package directly rather than via Python to avoid instantiating them in memory. However there is currently an issue which prevents this being done for sparse **DelayedArray** matrices.

#### **Known conversion issues:**

Coercion to factors:

The **anndata** package automatically converts some character vectors to factors when saving .h5ad files. This can effect columns of rowData(sce) and colData(sce) which may change type when the .h5ad file is read back into R.

#### Value

A NULL is invisibly returned.

#### Author(s)

Luke Zappia Aaron Lun

#### See Also

readH5AD(), to read a SingleCellExperiment file from a H5AD file.

SCE2AnnData(), for developers to create an AnnData object from a SingleCellExperiment.

## **Examples**

```
# Using the Zeisel brain dataset
if (requireNamespace("scRNAseq", quietly = TRUE)) {
    library(scRNAseq)
    sce <- ZeiselBrainData()

# Writing to a H5AD file
    temp <- tempfile(fileext = ".h5ad")
    writeH5AD(sce, temp)
}</pre>
```

# **Index**

```
* datasets
    AnnData-Environment, 6
.AnnDataDependencies
        (AnnData-Environment), 6
AnnData-Conversion, 3
AnnData-Environment, 6
AnnData2SCE, 8
AnnData2SCE (AnnData-Conversion), 3
AnnData2SCE(), 9
basilisk::BasiliskEnvironment(), 6
basilisk::basiliskRun(),6
basilisk::basiliskStart(),6
DataFrame, 5
dgCMatrix, 4
expectSCE, 7
int_metadata(),5
metadata(), 5
readH5AD, 7
readH5AD(), 5, 13
rowData(), 5
SCE2AnnData, 12
SCE2AnnData (AnnData-Conversion), 3
SCE2AnnData(), 13
setZellkonverterVerbose, 9
SingleCellExperiment, 3–5, 7, 9–13
validateH5ADSCE, 10
writeH5AD, 11
writeH5AD(), 5, 9
zellkonverter (zellkonverter-package), 2
zellkonverter-package, 2
{\tt zellkonverterAnnDataEnv}
        (AnnData-Environment), 6
```